

National Aeronautics and Space Administration



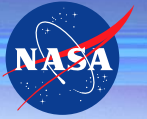
# HPC and Clouds at the NCCS: Measuring Woody Biomass on South Side of the Sahara at the 40-50 cm scale using AWS

IS&T Colloquium, NASA Goddard Space Flight Center  
04 November 2015

Daniel Duffy [daniel.q.duffy@nasa.gov](mailto:daniel.q.duffy@nasa.gov) and on Twitter @dqduffy  
High Performance Computing Lead at the  
NASA Center for Climate Simulation (NCCS) – <http://www.nccs.nasa.gov> and @NASA\_NCCS  
Goddard Space Flight Center (GSFC) – <http://www.nasa.gov/centers/goddard/home/>

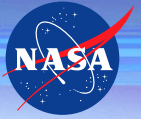
[www.nasa.gov](http://www.nasa.gov)

# Rats





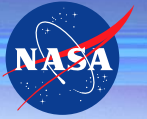
## Do climate records back that up?



“Analysis of 15 tree-ring records, which document yearly weather conditions, shows that Europe always experienced plague outbreaks after central Asia had a wet spring followed by a warm summer — terrible conditions for black rats, but ideal for Asia’s gerbil population. Those sneaky rodents and their bacteria-ridden fleas then hitched a ride to Europe via the Silk Road, arriving on the continent a few years later to wreak epidemiological havoc.”

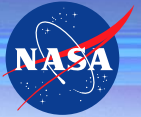
[http://www.washingtonpost.com/news/morning-mix/wp/2015/02/24/after-8-centuries-rats-exonerated-in-spread-of-black-death-gerbils-implicated/?tid=hp\\_mm](http://www.washingtonpost.com/news/morning-mix/wp/2015/02/24/after-8-centuries-rats-exonerated-in-spread-of-black-death-gerbils-implicated/?tid=hp_mm)  
<http://www.washingtonpost.com/news/morning-mix/wp/2015/06/21/star-teenage-athlete-dies-after-flu-symptoms-turn-out-to-be-plague/>

## Invasive Species – Pythons in South Florida

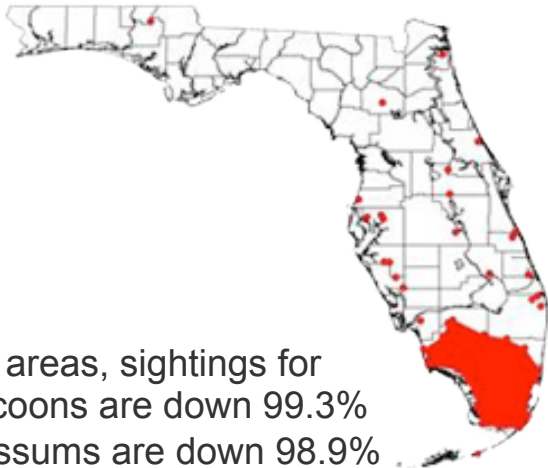




# Investigating climate suitability and invasive species



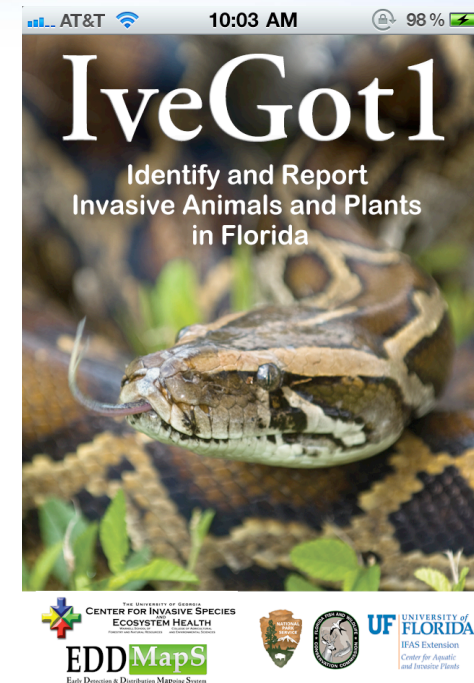
Observations of non-native Burmese pythons in Florida – moving Northwest.



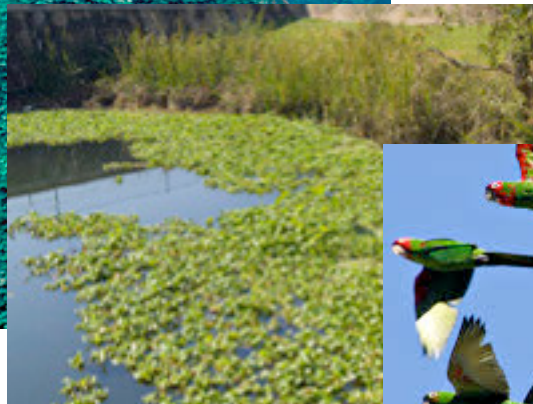
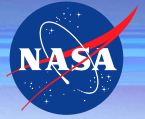
In these areas, sightings for

- Raccoons are down 99.3%
- Opossums are down 98.9%
- White-tailed deer are down 94.1%

Source – Proceedings of the National Academy of Sciences,  
“*Severe mammal declines coincide with proliferation of invasive Burmese pythons in Everglades National Park*”



# Estimated Damage from Invasive Species is more than \$1.4B



How will changes in climate affect invasive species and how should we prepare for them?

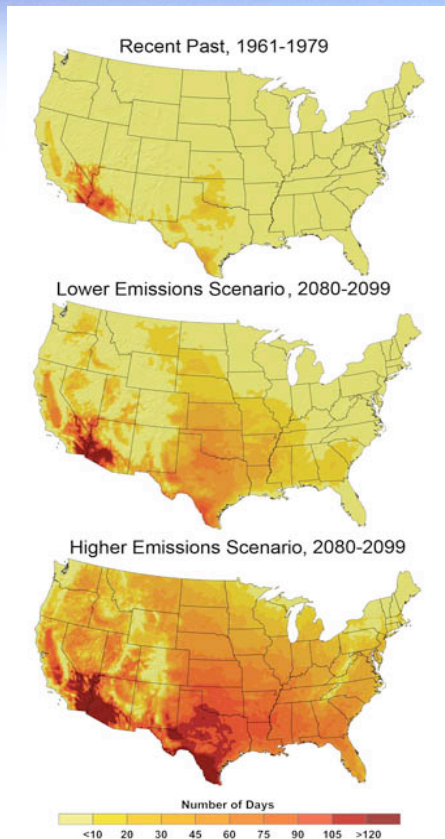
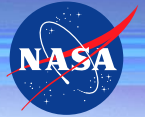
Source:

For more information: <http://www.invasivespeciesinfo.gov/index.shtml>

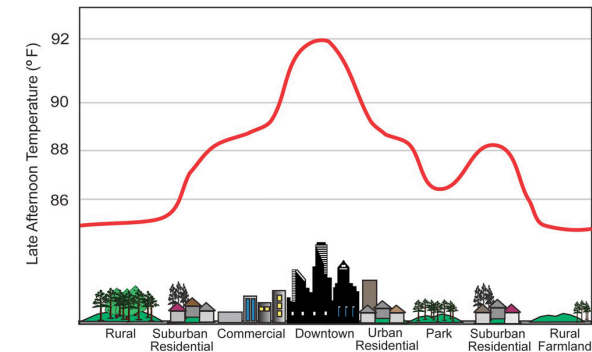




# What is the impact of heat waves on health?



These charts show the number of 100-degree days per year is projected to increase.  
Source: USGCRP (2009)



Heat waves in urban areas cause a large amount of health issues and loss of life for those less prepared to deal with excessive temperatures (older adults, young children, people with medical issues). How do we prepare for future heat waves?

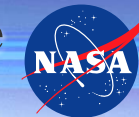
Source: USGCRP (2009)

Studies indicate that heat waves in the Northern Hemisphere will become more likely in the coming years due to climate change:

Source: <http://www.nasa.gov/topics/earth/features/warming-links.html>



# NASA Earth Science Division Project Won Intel Head in Clouds Challenge Award to Estimate Biomass in South Sahara



## Project Goal

- Using National Geospatial Agency (NGA) data to estimate tree and bush biomass over the entire arid and semi-arid zone on the south side of the Sahara

## Project Summary

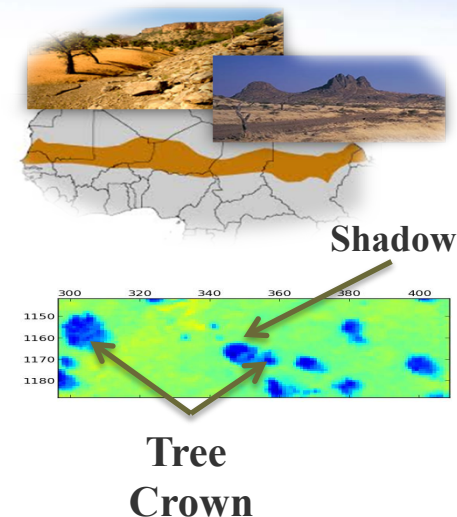
- Estimate carbon stored in trees and bushes in arid and semi-arid south Sahara
- Establish carbon baseline for later research on expected CO<sub>2</sub> uptake on the south side of the Sahara

## Principal Investigators

- Dr. Compton J. Tucker, NASA Goddard Space Flight Center
- Dr. Paul Morin, University of Minnesota

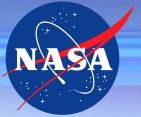
Reference: Tucker and Morin are extending earlier tree and bush mapping work published by Gonzalez, Tucker, and Sy entitled "Tree density and species decline in the African Sahel attributable to climate" in the Journal of Arid Environments in 2012.

National Aeronautics and Space Administration



NGA 40 cm imagery representing tree & shrub automated recognition

# Partners and Resources



## Intel

- Professional Services and Initial Funding for AWS Resources and code optimization



## Amazon Web Services (AWS)

- Compute and storage resources, support to set up the environment, consultation on how to obtain the best cost solutions



## Cycle Computing

- Cloud Resource Management and Data Movement Software
- Services to install and configure the software and get application running



## Climate Model Data Services (CDS – GSFC Code 600)

- NGA data support



## NASA Center for Climate Simulation (NCCS – GSFC Code 606.2)

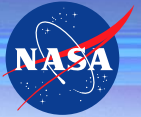
- System administration, application support, and data movement

## NASA CIO

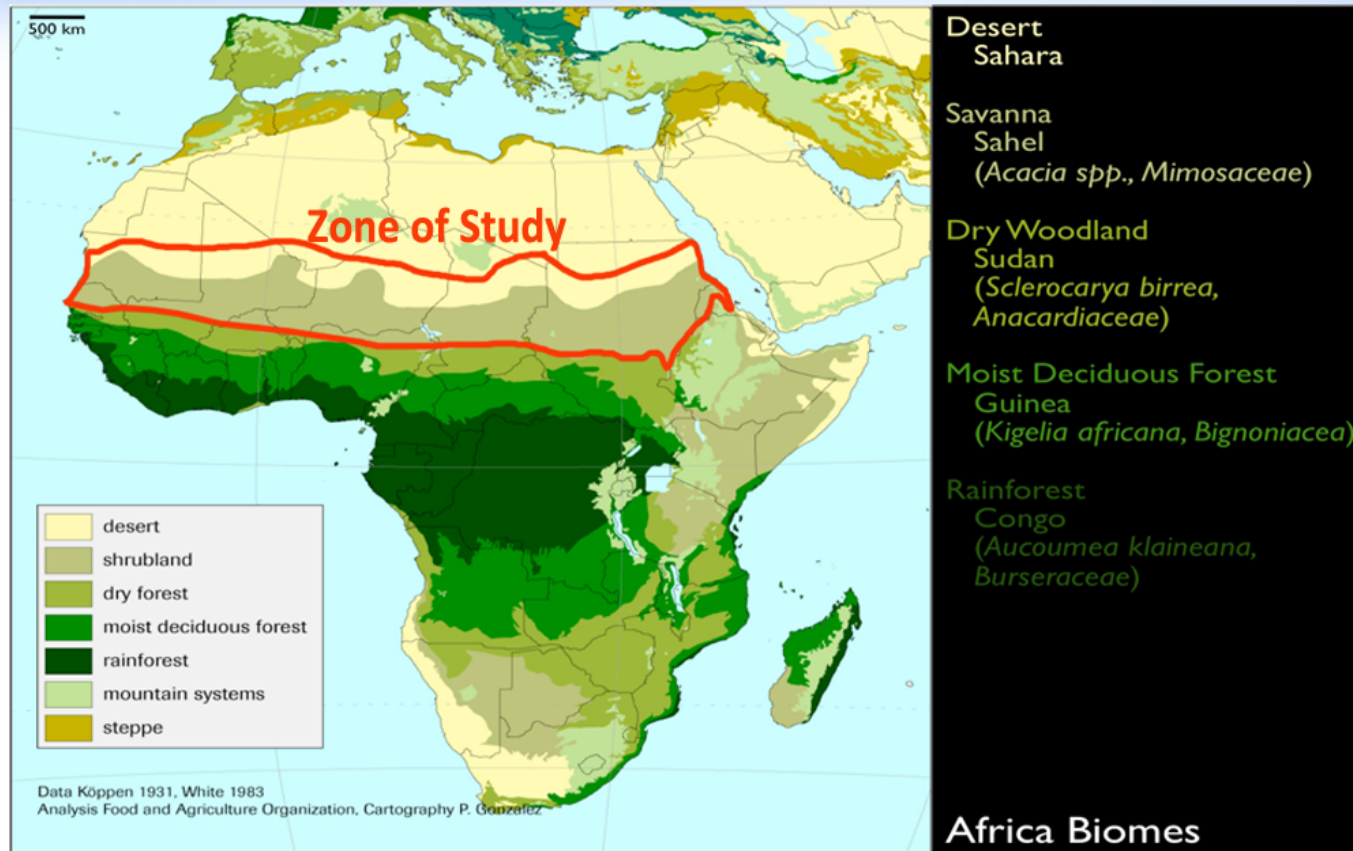
- General cloud consulting and coordination support, including networking







## Desired Full Zone of Study



# The DigitalGlobe Constellation

The Entire Archive is Licensed to the USG

Worldview 2

Geoeye

Quickbird

Ikonos

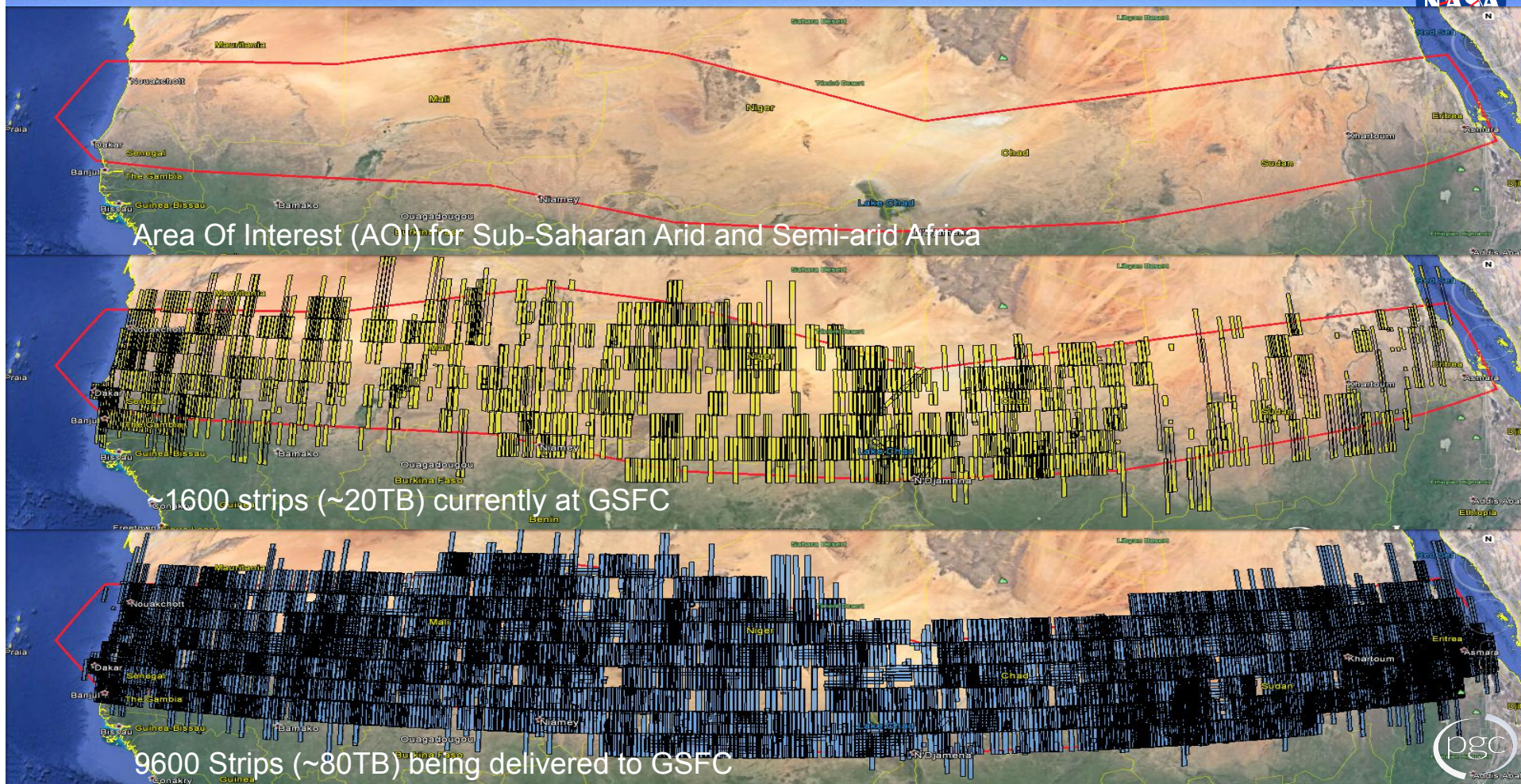
Worldview 3 (Available Q1 2015)

Worldview 1

DIGITALGLOBE

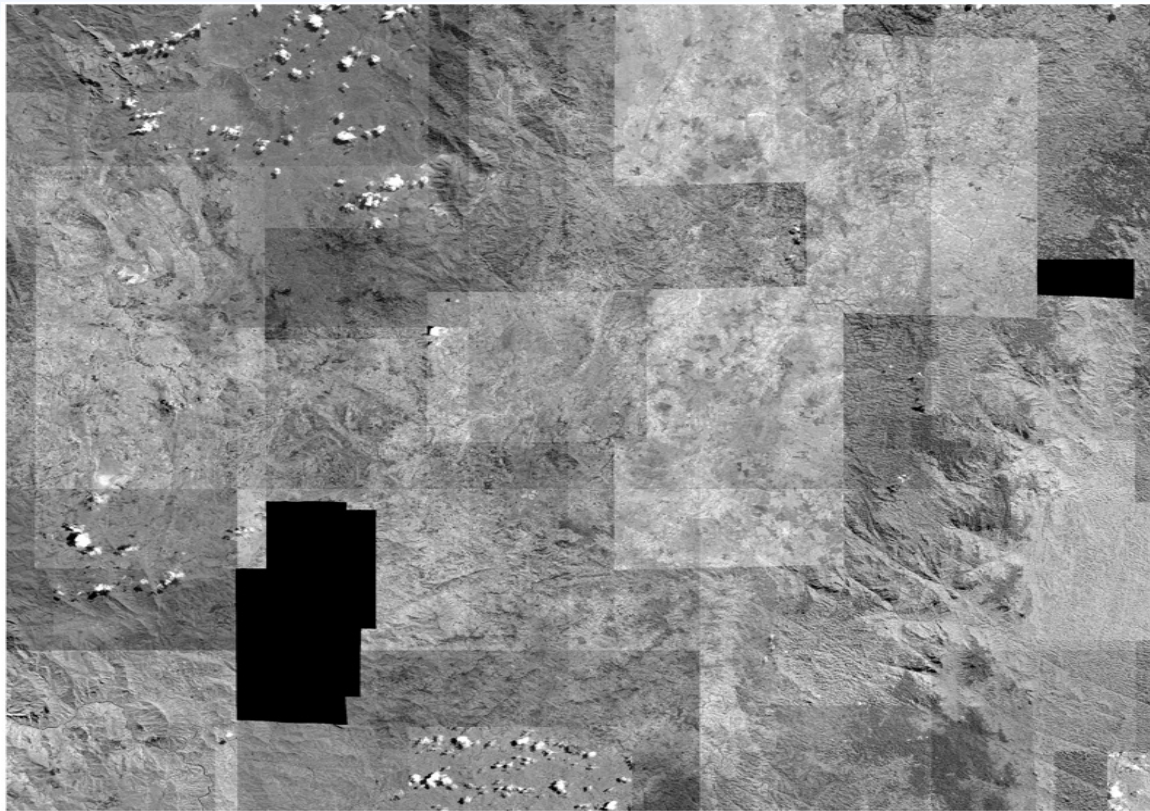
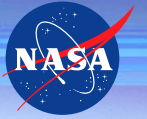


## Existing Sub-Saharan Arid and Semi-arid Sub-meter Commercial Imagery



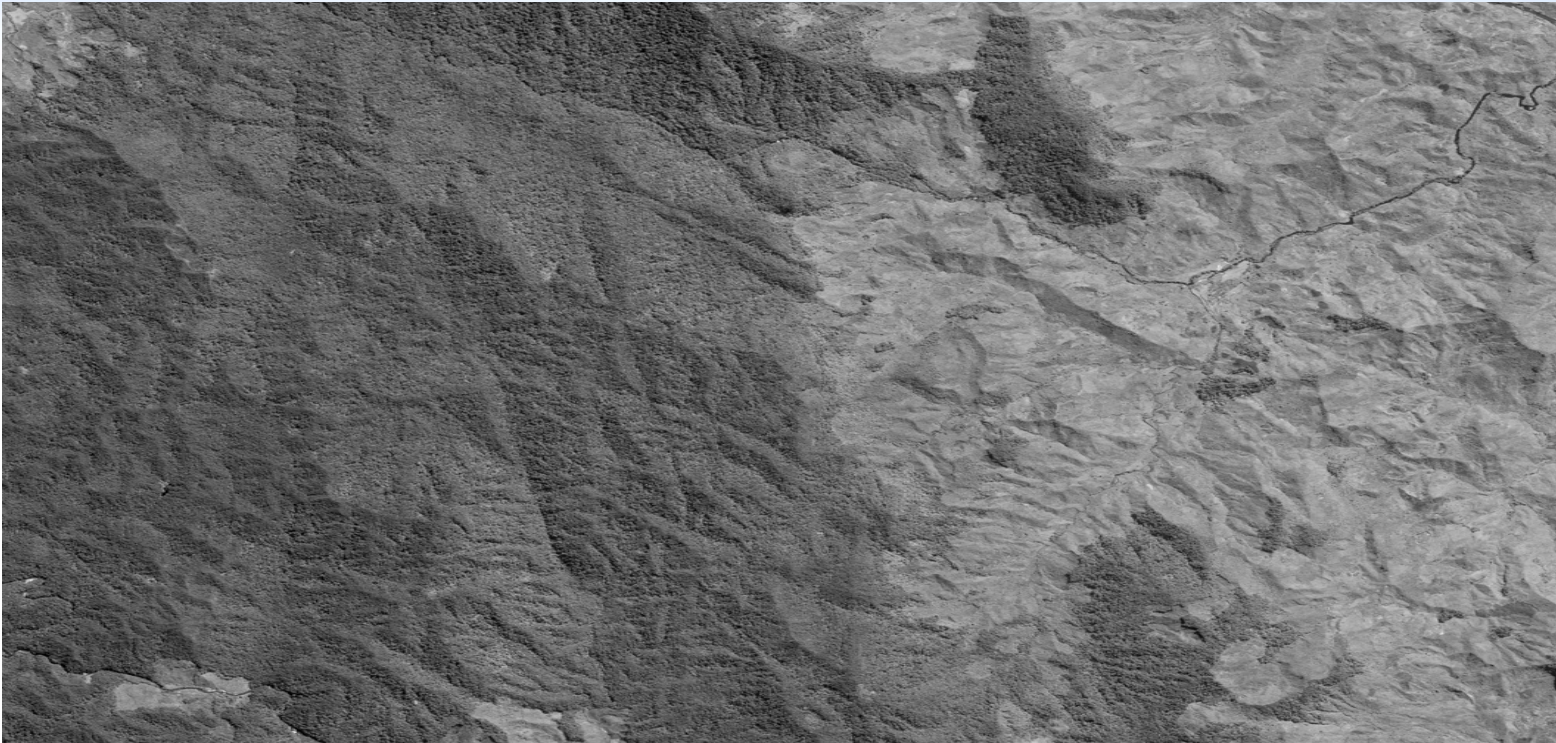
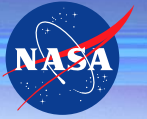


## Examples of Commercial Imagery Data



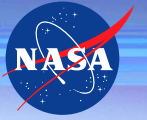
**100x100 km data  
block of  
commercial  
satellite data**

# Zooming in...

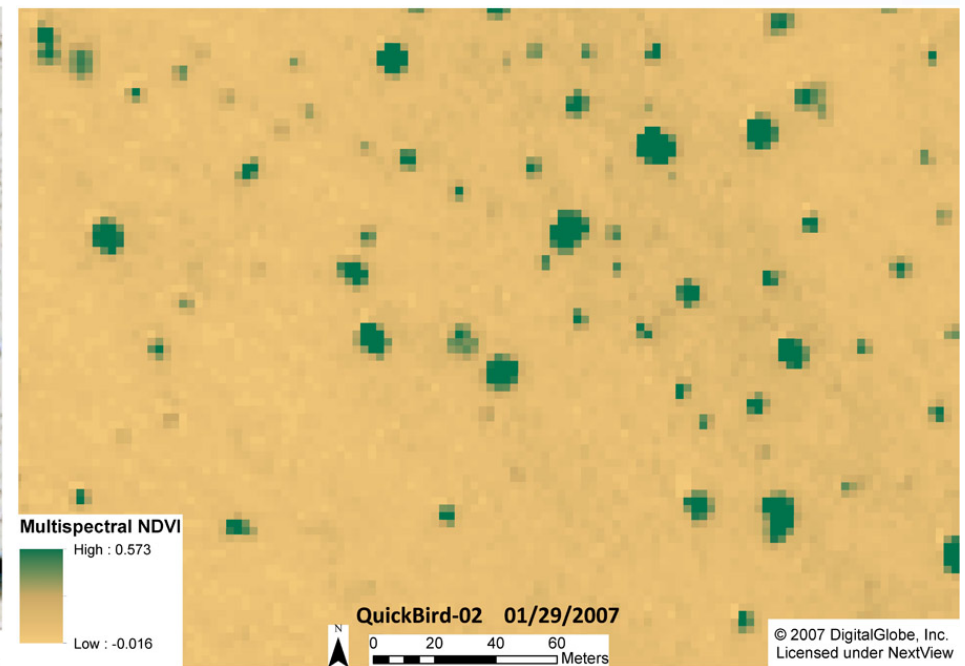
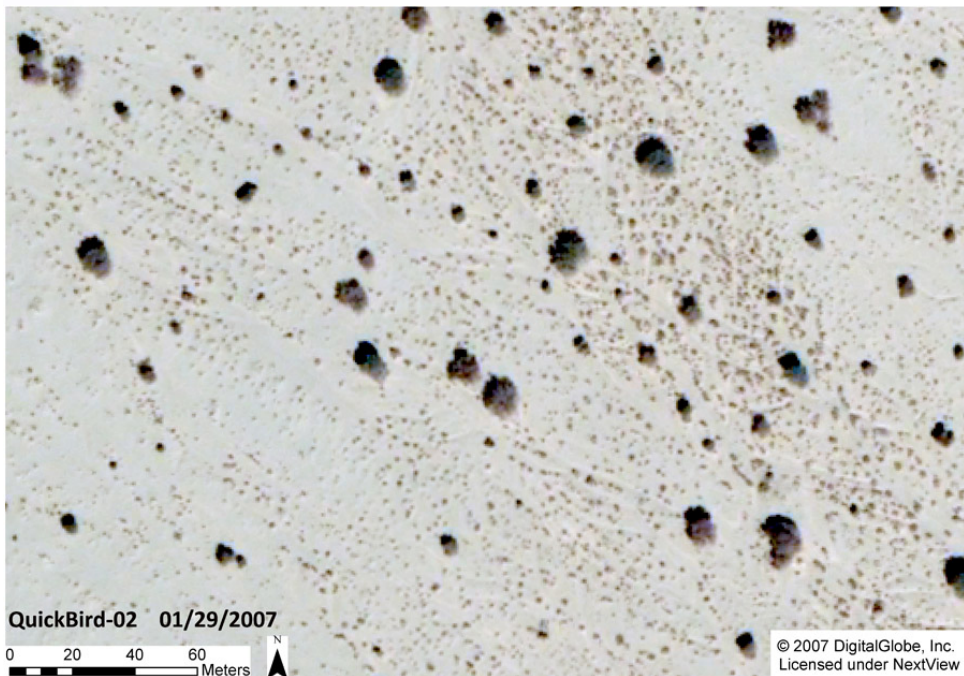
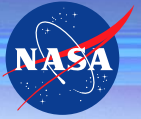




**Finally, you can see trees!**

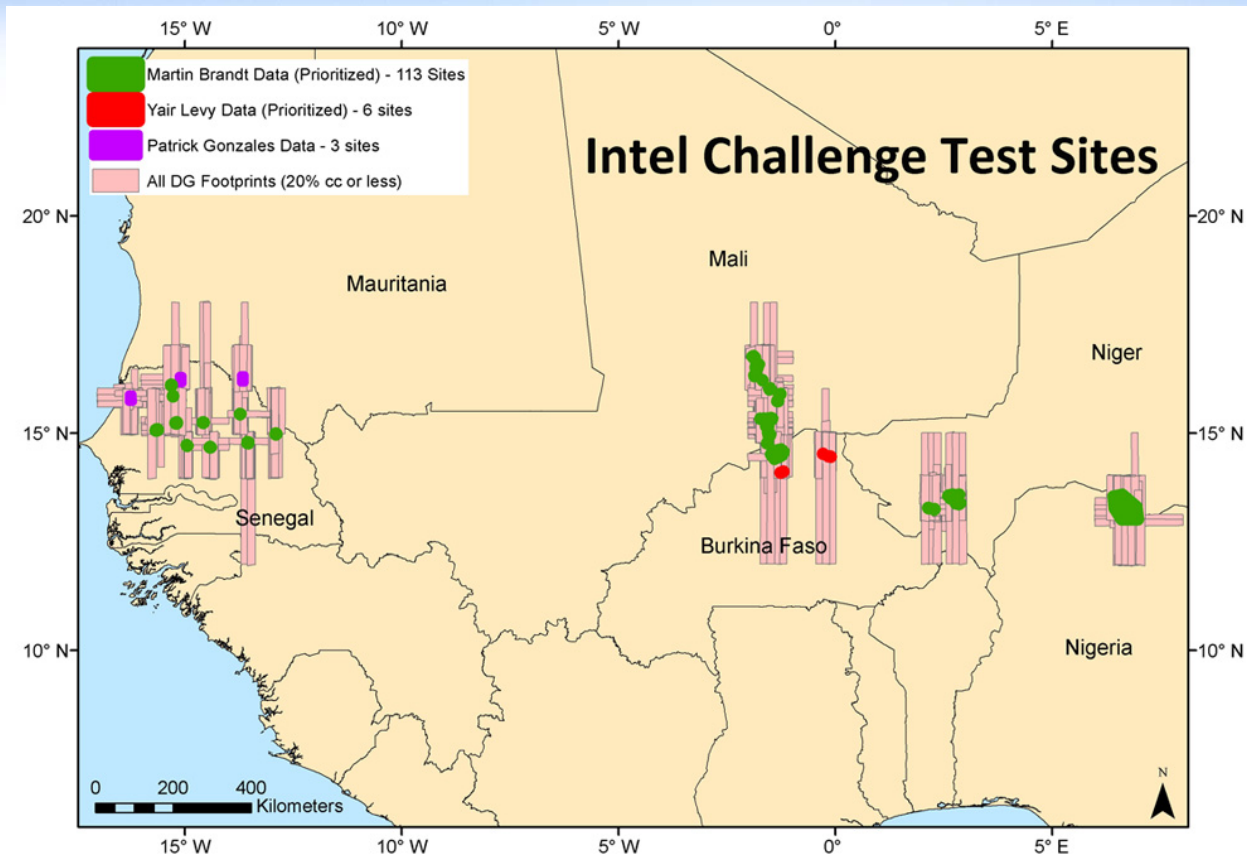
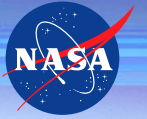


# Panchromatic & Multi-spectral Mapping at the 40 & 50 cm scale



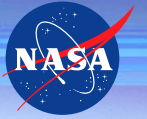


# Ground Validation



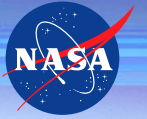


# Martin Brandt Measuring and Cataloguing Trees

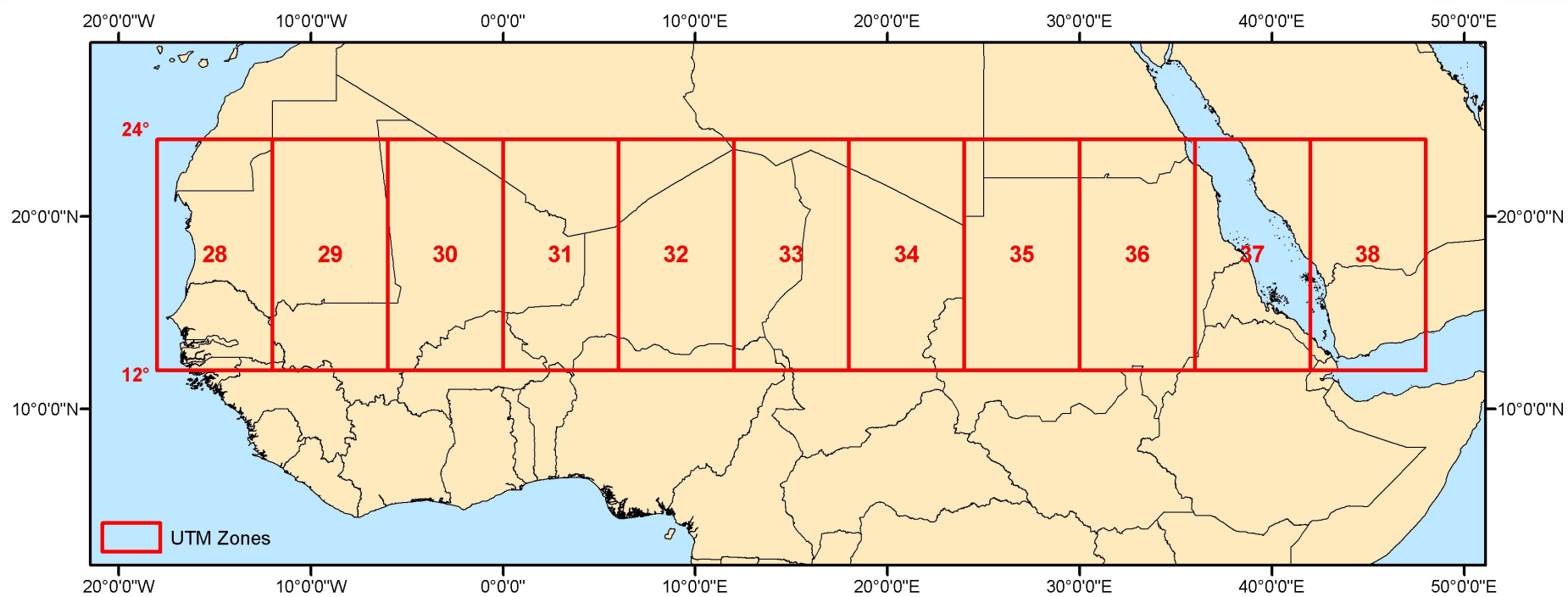
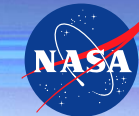




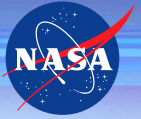
# Measuring and Cataloguing More Trees



# Break the Data Down by UTM Zones







# How to Break Down the Data?

***Polar circumference of the Earth = 40,008 KM***

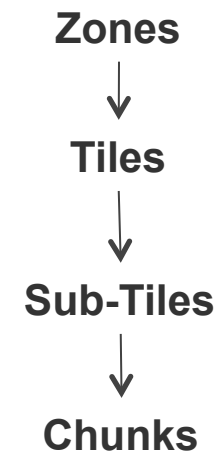
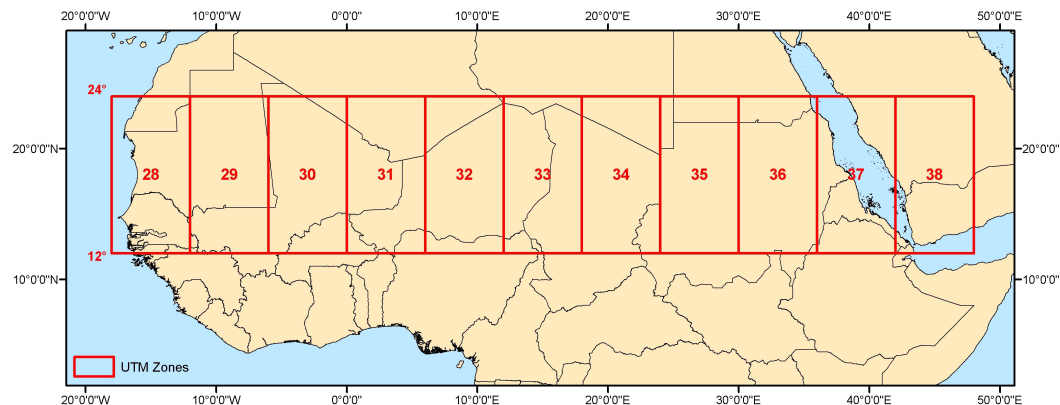
- 40,008 KM/360 latitude degrees = 111.13 KM/ latitude degree

***Equatorial circumference of the Earth = 40,075 KM***

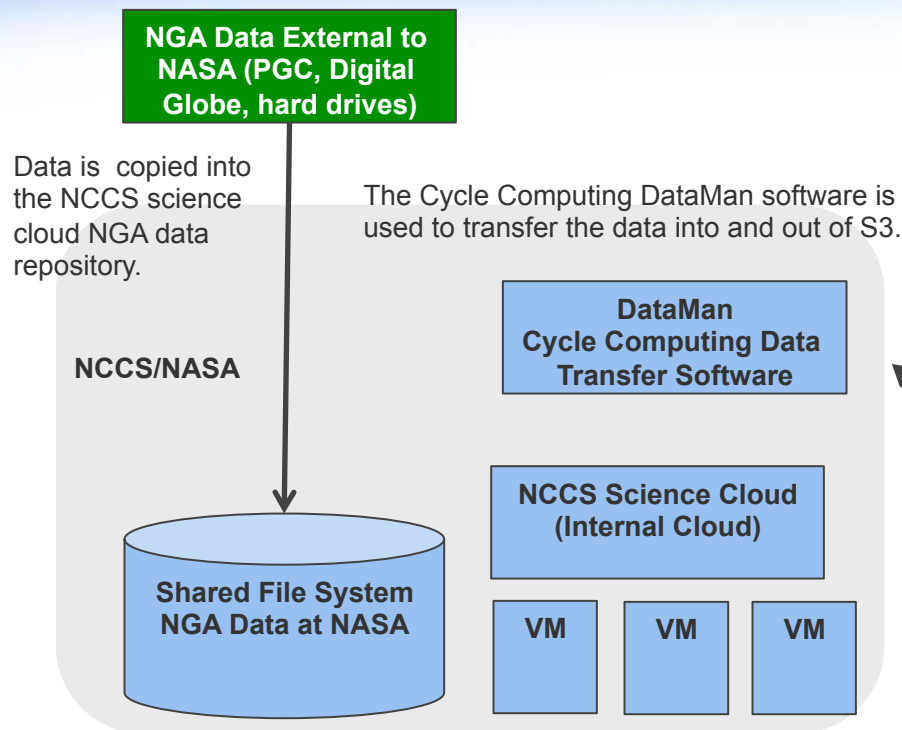
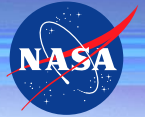
- 40,075 KM/360 longitude degrees = 111.32 KM/long degree

***Single UTM Zone (5.91 long degrees by 12.0 lat degrees)***

- 5.91 lon degree \* 111.32 KM/longitude degree = 657.9 KM
- 12 lat degree \* 111.13 KM/latitude degree = 1,333.56 KM



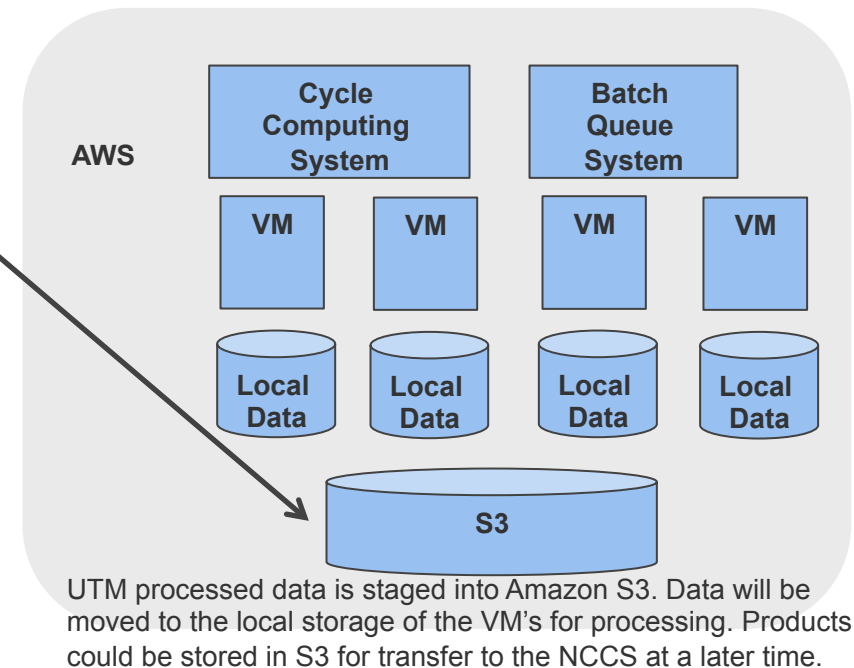
# Workflow – Hybrid Cloud



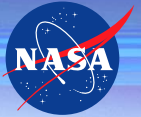
Virtual machines in the internal cloud read the data directly from the shared disk in the NASA internal cloud. No additional data movement is required. Data is preprocessed into UTM Zones here.

The Cycle Computing resource manager (batch queue) is running in AWS. Scientists interact and launch jobs through this system.

The batch queue launches virtual machines, runs the job, and shuts down those VMs upon completion of the job.



# AWS Resources



- **AWS East**
  - Initially started using resources closer to Goddard; worried about network bandwidth
- **AWS West**
  - US West (Oregon) Region, EC2 Availability Zones: 3, Launched in 2011; Green Data Center
- **AWS Commitment to Use Renewable Energy**
  - As of April 2015, approximately 25% of the power consumed by the AWS global infrastructure came from renewable energy sources.
  - By the end of 2016, AWS plans to reach the goal of 40% power from renewable energy sources.

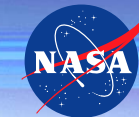


Network bandwidth between GSFC and AWS West is about 40-50 MB/sec.

For more information ... <http://aws.amazon.com/about-aws/sustainable-energy/>

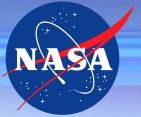


# AWS Cluster Configuration Requirements



Category	Description	Requirement
Number of Cores	How many cores are required on a single node for the application?	1 per sub-tile
Amount of Memory (RAM)	How much memory on a node (or per core) is required for the application?	Slightly more than 4 GB per sub-tile
Operating System (O/S)	What operating system does the application need?	CentOS
Libraries/Tools/Software	What additional libraries, tools, and software are needed to be installed? Compilers? Commercial software?	None; code written in python
Parallelization	Can the application run in a parallel manner? If so, how (threaded, MPI, or multiple instances of the application)?	Inherently parallel processing of each scene and/or tile
Cluster	If the application runs in parallel across many nodes, how many nodes are required?	100's to a few 1,000
Storage	How much storage space will be required for each run (input, intermediate, and output files)?	Total Input – 8 TB Total Output Back to NCCS – 2 TB ( approx. 25% of total input)
Shared Storage	Does this storage have to be shared across all nodes?	Using S3 to move data to local VM storage; S3 used to store output

# Test Runs Using AWS Spot Instances



## **Ran about 1/3 of UTM Zone 31 as a test with a single satellite**

- 200 virtual machines using AWS spot instances
- All jobs ran successfully and were not preempted
- Each job consumed about 4.3 GB peak of memory using a single core
- All results were pushed to S3

## **Showed that we can scale linearly; in other words, we can compute all UTM zones in the same amount of time.**

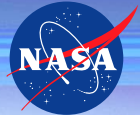
- To finish in about 6-7 hours, we would need
  - 11 UTM Zones \* 4 Satellites \* 600 VMs/UTM Zone = 26,400 VMs

### Spot Instances

- Propose a bid price for a spot instance
- Spot instances run when your bid price exceeds the spot price
- Not guaranteed to run indefinitely
- Reduce costs by 50% to 90% from on-demand instances



# Use Niger as the Test Case – UTM Zone 32



- **Input Data**

- Currently have about 16,000 total scenes covering Niger (the data is already orthorectified)
- Don't actually need to use all those scenes - Total input of about 8 TB or 3,120 scenes
- Average of about 2.63 GB of data per sub-tile

- **Output Data**

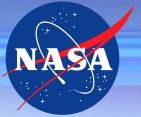
- Total output data is estimated to be 25% of the input data
- Estimated total output is about 2 to 3 TB
- Output data will be transferred back to the NCCS

- **Additional UTM Zones**

- Will scale up to run all UTM zones



# Okay, so how much does the compute cost?



## Using AWS spot instances

- The entire test run cost \$80.
- Can do an entire UTM zone for ~\$250.

**Cost for all 11 UTM Zones ~\$2,750**

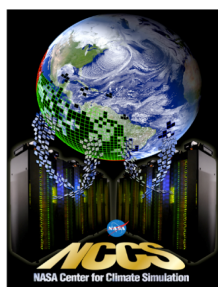
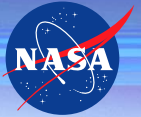
**Cost for all 11 UTM Zones and all 4 satellites ~\$11,000**

## Well, what about storage?

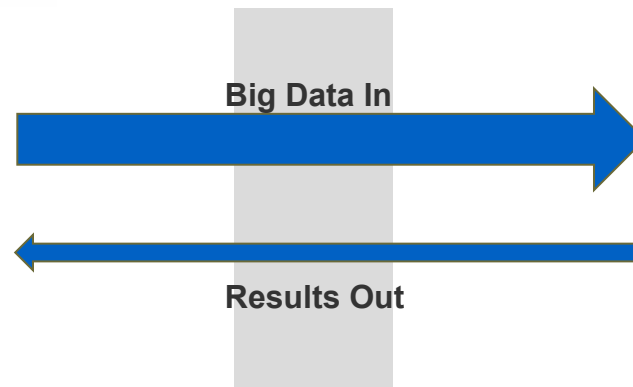
- There will be some costs for storage, but not much.
- Once the data is used, we will remove it from AWS.
- Only transfer out the results, which are much smaller than the inputs.

**These costs are well within the budgetary constraints of typical science proposals.**

# Make This a Service Within the NCCS



**ADAPT**  
**High  
Performance  
Science Cloud**



**Commercial Clouds**

**AWS  
MS Azure  
Other**

Private cloud within the NCCS designed for large-scale data analytics.

Ability to burst into commercial clouds as needed depending on science requirements.

Leveraging the NASA CIO Enterprise Cloud Computing services, science projects would provide funding to a WBS in NASA to get to commercial cloud offerings.

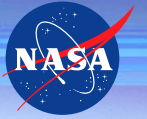
Potentially burst into multiple commercial clouds.

Leverage the best value solution for the science application.

Currently testing MS Azure with other applications.



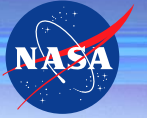
# Vision of the Future



**What is the future vision of the merging of Exascale computing with data analytics?**

**What can we learn from a Selective Attention Test?**

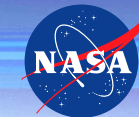
# Selective Attention Test References



<https://www.youtube.com/watch?v=vJG698U2Mvo>

<http://www.theinvisiblegorilla.com/>

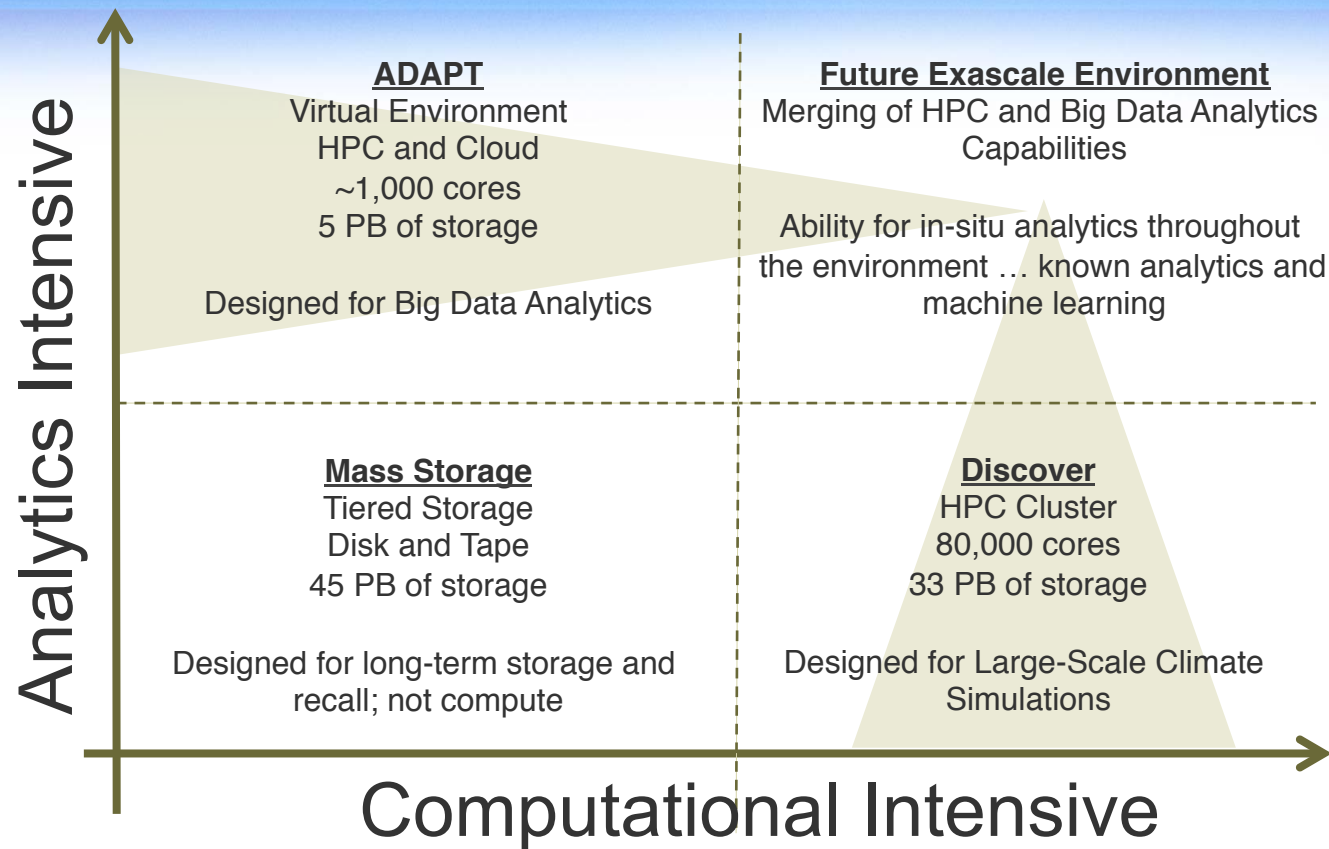
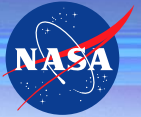
# The Growth of Climate Data



35-year Reanalysis	Resolution	Data Size
MERRA and MERRA2 – Current NASA reanalysis	50 KM	400 TB
Current NASA operational resolution (working toward 13 KM resolution)	25 KM	1.6 PB
Current NOAA operational resolution; 15 of 35 years will be complete by this fall (2015 – THIS YEAR)	13 KM	6.4 PB
Cloud permitting models, still parameterized (currently have a 2 year simulation)	7 KM	26 PB
Current high resolution climate runs (currently have a 3 month simulation)	3 KM	102 PB
Resolving deep convection – currently simulate 1 model day per wall clock day (model climate in real time)	1 KM	410 PB
Cloud permitting – working toward coupled models (atmosphere, cloud, ocean, wave, ice, etc.)	0.75 KM	1.6 EB

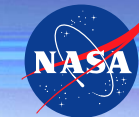


# The Future of Big Data and HPC at Exascale



<https://www.whitehouse.gov/the-press-office/2015/07/29/executive-order-creating-national-strategic-computing-initiative>

# Thanks goes many people ...



## **NASA**

- Dr. Compton Tucker (Co-PI/GSFC)
- John David (GSFC)
- Katherine Melocik (GSFC)
- Jennifer Small (GSFC)
- Dr. Tsengdar Lee (HQ)
- Dr. Daniel Duffy (GSFC)
- Mark McInerney (GSFC)
- Hoot Thompson (GSFC)
- Garrison Vaughn (GSFC)
- Brittany Wills (GSFC)
- Scott Sinno (GSFC)
- Ray Obrien (ARC)
- Richard Schroeder (ARC)
- Milton Checchi (ARC)

## **University Partners**

- Paul Morin (Co-PI, Univ. Minnesota)
- Claire Porter (Univ. Minnesota)
- Jamon Van Den Hoek (Oak Ridge)

## **Cycle Computing**

- Tim Carroll
- Michael Requa
- Carl Chesal
- Bob Nordlund
- Glen Otero
- Rob Futrick

## **AWS**

- Jamie Baker
- Jeff Layton

Special thanks to Intel for providing the initial research grant for AWS resources, and also AWS and Cycle Computing for their continued support. There are many others who have contributed... My apologies for those I missed. Another special thanks for many of the above that have to suffer through my conference calls every other week!